

# EIGENVALUE AND NEAR EIGENVALUE PROBLEMS SOLVED BY BRANDT'S MULTIGRID METHOD 

K. G. GUDERLEY<br>UNIVERSITY OF DAYTON RESEARCH INSTITUTE<br>300 COLLEGE PARK AVENUE<br>DAYTON, OHIO 45469<br>DONALD S. CLEM<br>APPLIED MATHEMATICS GROUP<br>AFFDL/FBRD<br>SEPTEMBER 1979<br>TECHNICAL REPORT AFFDL-TR-79-3147<br>Interim Report for period May - June 1979

Approved for public release; distribution unlimited.

AIR FORCE FLIGHT DYNAMICS LABORATORY
AIR FORCE WRIGHT AERONAUTICAL LABORATORIES
AIR FORCE SYSTEMS COMMAND
WRIGHT-PATTERSON AIR FORCE BASE, OHIO 45433

$$
\times 08 \cdot 2.051
$$

## NOTICE

When Government drawings, specifications, or other data are used for any burpose other than in connection with a definitely related Government procurement operation, the United States Government thereby incurs no responsibility nor any obligation whatsoever; and the fact that the government may have formulated, furnished, or in any way supplied the said drawings, specifications, or other data, is not to be regarded by implication or otherwise as in any manner licensing the holder or any other person or corporation, or conveying any rights or permission to manufacture, use, or sell any patented invention that may in any way be related thereto.

This report has been reviewed by the Information office (OI) and is releasable to the National Technical Information Service (NTIS). At NTIS, it will be available to the general public, including foreign nations.

This technical report has been reviewed and is approved for publication.

## Charles K. Keller

CHARLES L. KELLER
Project Fingineer
Applied Mathematics Group
Analysis and Optimization Branch


FREDERICK A. PICCHIONI, Lt Col, USAF Chief, Analysis \& Optimization Br Structures \& Dynamics Division

FOR THE COMMANDER


RALPH L. KUSTER, Jr, COI, USAF
Chief, Structures and Dynamics Division

[^0]Copies of this report should not be returned unless return is required by security considerations, contractual obligations, or notice on a specific document.


SECURITY CLASSIFICATION OF THIS PAGE(Whan DAIE Entored)
20. (continued)
solution in the coarse grid may differ widely from the corresponding approximation in a finer grid, if the frequency defined by the inhomogeneous problem is close to one of the eigenfrequencies. This may be detrimental to the aim of the coarse grid step; namely to remove from an approximation in a fine grid long waves which cause divergence of fine grid iterations. This is remedied by eliminating long wave contributions to the residual directly in the next finer grid. The success of this procedure still depends upon the choice of the subspace from which the long wave corrections in the finer grid are taken. Even this modified method fails if the frequency pertaining to the inhomogeneous term is too close to an eigenvalue, unless the subspace contains the pertinent eigenfunction.

In dealing with the eigenvalue problem one must update the eigenfunctions and eigenvalues in each iteration step and in addition remove long wave perturbations pertaining to eigenfunctions with frequencies lower than that currently under evaluation. Multiple eigenvalues and eigenvalues that lie close together are treated simultaneously.

## FOREWORD

The work was performed as a joint project between K.G. Guderley working under Grant AFOSR-78-3524 and Donald S. Clemm, US Air Force, Project 2304N102.

The authors express their appreciation for the excellent typing of Miss Norma Harting and the art work of the staff of the University of Dayton.


## TABLE OF CONTENTS

SECTION PAGE
I INTRODUCTION ..... 1
II DESCRIPTION OF THE SAMPLE PROBLEM ..... 2
III EIGENVALUES AND EIGENFUNCTIONS ..... 5
IV COMPUTATION IF $\mu$ IS NOT AN EIGENVALUE ..... 7
V EIGENVALUE PPOBLEMS ..... 14
VI NUMERICAL EXPERIENCES IN THE TREATMENT OF EIGENVALUE PROBLEM ..... 20
REFERENCE ..... 21FIGUREPAGE
1 Region for which the Computations are carried out. ..... 3
2 Number of Iterations to Convergence for the ..... 13Inhomogeneous Problem with Different Functionsfor the Interpolation from the Coarse to theFine Grid.

## SECTION I <br> INTRODUCTION

The present report describes some examples for Brandt's multigrid method (Ref. 1). The primary purpose is to gain some direct working experience. We have not used ready-made programs which, presumably, are available by now, and we have even disregarded some of the finer points of Ref. l. The examples chosen are simple but not entirely trivial; we seek solutions to the Helmholtz equation for frequencies which exceed the lowest eigenfrequency of the problem. Cases of this kind are included in Brandt's work, at least in principle; but additional considerations are needed if the frequency is above that pertaining to the lowest eigenvalue and in particular if the frequency is close to one of the eigenvalues. In this respect, there is an element of novelty in the present discussions. To obtain results which are completely satisfactory in the latter case, one needs the eigenfunctions which pertain to the eigenvalues in the vicinity of the driving frequency. A modification of Brandt's procedure by which such eigenvalues and eigenfunctions can te computed is therefore included.

The work was initiated because of its possible usefulness for the flutter problem. One must realize, however, that for this problem the boundary conditions at a large distance are of a nature which precludes the occurrence of standing waves. The eigenvalue problem as such has no direct bearing on the flutter problem. In other respects Brandt's multigrid approach is likely to be very useful for problems of this kind, especially if the frequencies are not low.

## SECTION II

DESCRIPTION OF THE SAMPLE PROBLEM

The region for which the numerical solution of the Helmholtz problem is carried out is square (Fig. l). Along the boundary of the region, Dirichlet conditions are prescribed. The fine grid is obtained by dividing each side of the square into 12 intervals. The grid size of the coarse grid is four times that of the fine grid. This choice is not optimal; Brandt suggests a ratio of $2: 1$ for the grid parameters. Brandt envisages the use of more than two grids, while our examples use only two grids. If there are more than two grids, then one must decide when one should go to a finer or to a coarser grid. In this regard the present example fails to cover all aspects of Brandt's procedure.

The Helmholtz equation reads

$$
\begin{equation*}
\varphi_{x x}+\varphi_{y y}+\mu \varphi=0 \tag{1}
\end{equation*}
$$

where $\mu$ (the square of the frequency) has a fixed value. The difference form of this equation is

$$
\begin{equation*}
\varphi_{i+1, i}+\varphi_{i-1, j}+\varphi_{i, j+1}+\varphi_{i, j-1}-4 \varphi_{i j}+\mu^{2} \varphi_{i j}=0, \quad i=1, \cdots, 11 \tag{2}
\end{equation*}
$$

where $i$ and $j$ give the numbering of the grid in the $x$ and $y$ directions, respectively, and $h$ is the distance between adjacent grid points. The boundary conditions are

$$
\begin{equation*}
\theta_{i, j}=0, \quad i=0, \quad i=12, i=0, j=12 \tag{3}
\end{equation*}
$$

In the fine grid, one has 121 unknowns (the values of $\phi_{i j}$ at the inner grid points). In the coarse grid, one has a system of four equations.

Because of the lack of an inhomogeneous term, this system has only the trivial solution $\phi_{i j}=0$ unless $\mu$ is an eigenvalue. The values of $\phi_{i j}$ which arise in the course of the present computations therefore give the errors immediately. The

solution process ought to reduce the errors to zero. In a more realistic problem the error never appears separately; one encounters approximate expressions, "ij, which are the sum of the exact solution and the current error. The presence of errors manifests itself in terms of "residuals" obtained by substituting the current approximation into the difference form (Eq. (2)) of the differential equation. In our discussions we are interested only in solutions to the difference equations, the question of truncation error is of a different nature.

## EIGENinilues AND EIGENFUNCTIONS

In the present example one can determine the eirjenval'es and eigenfunction for the difference form of the Laplace operator in a closed form. Of course this information should not be used in the numerical work; it is used to show for which values of : difficulties may be expected.

The (nonnormalized) eigenfunctions are given by

$$
\begin{equation*}
\varphi_{i k}=\sin \left(\frac{\pi}{12} n i\right) \sin \left(\frac{\pi}{12} m k\right) ; n=1, \cdots ; 1 \prime ; m=1 \cdots ; " \tag{4}
\end{equation*}
$$

Substituting this into Eq. (2) one obtains

$$
\begin{equation*}
\left.\mu_{n m} h^{2}=4 \cdot\left(\sin ^{2} \cdot \frac{n \pi}{24}\right)+\sin ^{2}\left(\frac{m x}{24}\right)\right] ; n=1 \cdots 1 / ; m=5 \cdots / 1 \tag{5}
\end{equation*}
$$

The eigenvalues pertaining to Eq. (l) are

$$
\begin{equation*}
\mu_{n} h^{2}=\left(\frac{\pi}{12}\right)^{2}\left[n^{2}+m^{2}\right] ; \quad n=1,2, \cdots, \quad m=1,2, \cdots \tag{6}
\end{equation*}
$$

The two expressions approach each other if $n$ and $m$ are sufficiently small.

For the coarse grid the eigenfunction are again given by Eq. (4) with $i=4$ and 8 , and $k=4$ and 8. The pertinent eigenvalues are

$$
\begin{equation*}
\mu_{n m} h^{2}=\frac{1}{4}\left[\sin ^{2}\left(\frac{n \pi}{6}\right)+\sin ^{2}\left(\frac{m \pi}{6}\right)\right] ; n=1,2 ; m=1,2 \tag{7}
\end{equation*}
$$

The eigenfunction for the coarse grid can be found simply by inspection

$$
\begin{array}{lll}
n=1, & m=1: & \varphi_{44}=\varphi_{48}=\varphi_{84}=\varphi_{88}=1 \\
n=1, & m=2: & \varphi_{44}=\varphi_{84}=1 ; \varphi_{48}=\varphi_{88}=-1 \\
n=2, m=1: & \varphi_{44}=\varphi_{48}=1 ; \varphi_{84}=\varphi_{88}=-1 \\
n=2, m=2: & \varphi_{44}=\varphi_{88}=1 ; \varphi_{48}=\varphi_{84}=-1
\end{array}
$$

The first four values of ph ${ }^{2}$

|  | coarse arid | finc orid | differential equation |
| :---: | :---: | :---: | :---: |
| n 1, m: 1 | 0.125 | 0.13630 | 0.13708 |
| $\begin{array}{lll} n & 1, & m \\ n & 2 & m=1 \end{array}$ | 0.3 | 0.33610 | 0.34269 |
| n . $\quad$, m ? | $0.17!$ | 0.53590 | 0.54831 |

The computation proceeds in the following steps:

1. Introduction of a starting solution for the fine grid.
2. Fine grid iterations (in our examples carried out by the alternating direction method). Terminate the procedure if it converges.
3. If the fine grid iterations converge slowly or diverge, then one computes the residuals for the fine grid and transfers them to the coarse grid. (According to Brandt it is most conomical if one simply evaluates the fine grid residuals for the points of the coarse grid.)
4. Computation of corrections in the coarse grid, either by iteration or by direct solution of the system of equations for the coarse grid.
5. One transfers these corrections to the fine arid by means of an interpolation and adds these corrections to the fine arid values of "ik obtained at the end of step 2. Return to step 2.

We make the following observation: Steps 3, 4 and 5 are carried out in ordor to romove, as well as possible, long wave contributions which appear in the results of the fine grid itcrations. This purpose may not be achieved by the procedure just described if $H$ is close to one of the eigenvalues of the problem.

This difeiculty can be ascribed to the fact that the eiqenvalues are not the same in the coarse and in the fine qrid. The following example shows that the corrections obtained in the coarse grid may be quite unrelated to the corrections needed in the fine grid. Assume that $\|$ coincides with a coarse grid eigenvalue. The corrections in the coarse qrid are obtained
by solving an inhomogeneous system of simultaneous linear equations. If $\mu$ is a coarse grid eigenvalue, then the solution will be infinite although the contribution of long wave errors in the fine grid is definitely finite.

The elimination of long wave contributions can actually be accomplished without solving the problem in the coarse grid. One notices that the coarse grid corrections depend upon a number of parameters which is equal to the number of grid points in the coarse grid. By an interpolation one obtains a fine grid correction for each of these possible coarse grid corrections. The elimination of long wave contributions in the fine grid can therefore be accomplished by adding to the current fine grid approximations a linear combination of the interpolated coarse grid corrections. The coefficients with which these functions are multiplied are determined in such a manner that, as far as possible, the long waves are eliminated from the fine grid approximation. The criteria by which these coefficients are determined must, of course, be derived from the fine grid residuals (see the remark at the end of Section II). Accordingly, one computes in advance the residuals in the fine grid belonging to the interpolated coarse grid corrections. In the present case there are four linearly independent residual functions of this kind. Assume that one has carried out a number of alternating direction steps. One then possesses a fine grid approximation and pertaining to it a fine grid residual. From this residual, and subsequently from the approximation for $\phi$, one wants to remove long wave contributions. Let $R(\phi)$ be the residual for the approximation obtained at the end of the alternating direction iteration. Let $R(\phi$ coarse, $i)$ be the residual for the $i^{\text {th }}$ coarse grid expression after interpolation to the fine grid. In the present example i $=1, \ldots .4$. According to the idea just described above, we form

$$
\begin{equation*}
R=R(\phi)+\sum_{i} \alpha_{i} R\left(\phi_{\text {coarse }, i}\right) \tag{8}
\end{equation*}
$$

It is our goal to determine the coefficients $\alpha_{i}$ so that long wave contributions are (approximately) removed from R.

This task could be done perfectly if exact long wave eigenfunction were known. The long wave eigenfunction are approximated by linear combinations of the interpolated coarse grid expressions coarse,i. (If one would compute the coarse grid eigenfunction and then proceed to the fine grid by interpolation, then one would obtain just such expressions.) This leads to the following procedure. Let the scalar product of two functions $u$ and $v$ defined at the grid points be given by

$$
\begin{equation*}
[u, v]=\sum_{m, n} u_{m, n} r n, n \tag{9}
\end{equation*}
$$

Now we impose the requirement that

$$
\begin{equation*}
\left\langle\phi_{\text {coarse }, i}, D_{7}\right\rangle=0 ; i=1, \cdots, 4 \tag{10}
\end{equation*}
$$

This leads to the system of equations

$$
\begin{equation*}
H \alpha+r=0 \tag{11}
\end{equation*}
$$

where $M$ is a matrix with components

$$
\begin{equation*}
M_{m y x}=\left[\phi_{\text {coarse, me }}, R\left(\phi_{\text {coarse }, x}\right)\right] \tag{12}
\end{equation*}
$$

, is a vector whose $n^{\text {th }}$ component is given by $\alpha_{n}$, $r$ is a vector whose $m^{\text {th }}$ component is given by

$$
\begin{equation*}
r_{m}=\left[\phi_{\text {coarse, } m,} R(\phi)\right] \tag{23}
\end{equation*}
$$

The matrix $M_{m, n}$ is symmetric. Let $L$ be the difference operator defined by Eq. (2). Then one can define an eigenvalue problem

$$
\left(L-\lambda_{4} T\right) \phi_{r}=0
$$

The eigenfunction $\phi_{k}$ are orthogonal to each other

$$
\begin{equation*}
\left[\phi_{13}, \phi_{B_{2}}\right]=0, \quad k_{1} \neq k_{2} \tag{14}
\end{equation*}
$$

The residual pertaining to $\phi_{\mathrm{k}}$ is given by

$$
\begin{equation*}
R\left(\phi_{k}\right)=L\left(\phi_{k}\right)-\lambda_{k} \phi_{k} \tag{15}
\end{equation*}
$$

Now assume that $\phi_{\text {coarse, } i}$ is represented in the form

$$
\phi_{\text {carse }, i}=\sum_{k} \phi_{i k} \phi_{k}
$$

Then one has

Finally, because of the orthogonality relations Eq. (14)

$$
M_{m, n}=\sum_{k} \operatorname{sim}_{\operatorname{man}} \operatorname{tank} \lambda_{k}\left[\phi_{0}, \phi_{n}\right]
$$

Hence

$$
\begin{equation*}
M_{n, x}=M_{n, m} \tag{16}
\end{equation*}
$$

The system Eq. (11) arises by forming scalar products of the expression Eq. (8) with the functions $\phi_{\text {coarse, }}$. In a first version we had introduced the condition that the scalar product of the residual with itself should be a minimum. This leads to a condition similar to Eq. (10), except that now the weight functions are given by $R\left(\phi\right.$ coarse, $m$ ), rather than $\phi_{\text {coarse, }}$ itself. If $\mu$ is close to the square of an eigenfrequency, then one of the eigenvalues $\lambda$ is close to zero, and the contribution of the pertinent eigenfunction is nearly suppressed in the weight function R(* coarse, m). This is undesirable for the purpose of the computetion is to remove the contributions of these eigenfunction.

According to these considerations, we replace steps 3, 4 and 5 by the following procedure. In preparing for the computations, one determines the elements of the matrix $M$ (a 4 by 4 matrix in the present example). At the end of step 2 , that is, after one has decided that the convergence is too slow one evaluates the residual $R(\phi)$ pertaining to the current approximation, forms the components of the vector $\mathrm{r}, \mathrm{Eq}$. (13), and then solves the system Eq. (ll) for the vector $\alpha$.

With the values of $\alpha_{i}$ so obtained, one forms a corrected function $\phi$

$$
\begin{equation*}
\phi_{\text {corrected }}=\phi+\sum_{i} \alpha_{i} \phi_{\text {coarse }, i} \tag{17}
\end{equation*}
$$

and returns to the beginring of step 2. Notice that the system for the $\alpha_{i}$ has the same dimension as the system of equations which one would obtain in a direct treatment of the coarse mesh (step 4 of the procedure outline above).

One notices that if $\mu$ is close to the square of the $j^{\text {th }}$ eigenfrequency, say $n$, then the contribution of the $j^{\text {th }}$ eigenfunction to the expressions $R\left(\phi_{\text {coarse, }}\right)$ and consequently to the elements of the matrix $M$ is small. (Of course the contribution of this eigenfunction to the inhomogeneous term $R(\phi)$ is also small.) Consequently, the effect of this eigenfunction on the determination of the coefficients $\alpha_{i}$ becomes small and the goal of the computation, namely the approximate removal of the eigenfunctions $\phi_{i}$ from the current approximation $\phi$ (see Eq. 17) is not achieved. The interval of values $\mu$ in which this failure occurs depends upon the character of the functions $\phi_{\text {coarse, }}$ 's, for this determines how strongly eigenfunctions other than the $\phi_{k}$ (here $k=1, \ldots, 4$ ) occur in the coarse, $n^{\prime}$ s. These other eigenfunctions will then play the dominant role in the matrix $M$ and lead to faulty values of $\alpha$. The width of the interval $\mu$ in which the approach fails depends upon the interpolation formula by which one proceeds from the coarse to the fine mesh. Best results would be obtained if the functions ${ }^{\text {coarse, } n}$ span the same subspace as the eigenfunctions $\phi_{\mathrm{n}}$ (in our case $\mathrm{n}=1, \ldots, 4$ ).

These observations are borne out by our computations, which have been carried out for different interpolation routines from the coarse to the fine grid. In routine 1 linear interpolation has been used. In routine 2 , we have used a third degree interpolation formula for both the $x$ and $y$ direction. (This is possible in the present example because the eigenfunctions arise from a product hypothesis and because, with the boundary points included, the coarse grid has only 4 points in the $x$, and 4 points in the $y$ direction.) In routine 3 , exact eigenfunctions are used.

Figure 2 gives a survey of the results. The horizontal axis shows the values of $\mu^{1 / 2}$ (one might just as well use $\mu$ as independent variable). The eigenfrequencies for which we expect difficulties are shown by short heavy lines. The vertical directions show the number of iteration steps to convergence. If convergence is not attained by five iterations but might have been attained by more iterations, then the solid lines are drawn up to the upper end of the graph. Divergence is shown by dashed lines. As expected, there is an interval around the eigenfrequencies where the method fails to converge. This interval becomes smaller as one uses a better interpolation formula. If one uses the exact eigenfunctions to remove long wave perturbations from the residual, then one has convergence even very close to the eigenvalues. In this case, the size of the interval depends only on the precision with which the computations are carried out. In all cases the convergence is slower for larger values of $\mu$. No convergence is obtained if $\mu$ is too large.


THIRD DEGREE INTERPOLATION


CORRECT EIGEN FUNCTIONS

Figure 2. Number of Iterations to Convergence for the Inhomoreneous nroblem with Different Functions for the Interpolation from the Coarse to the Fine rrid.

The eigenvalue problems for the Helmholtz equation and the Laplace equation are the same except for a shift of the eigenvalues by a constant amount. The following discussion is therefore restricted to the eigenvalue problem for the Laplace operator. Let

$$
\begin{equation*}
[L(u)]_{i k}=u_{i, k+1}+u_{i, k-1}+u_{i+1, k}+u_{i-1, k}-4 u_{i k} \tag{18}
\end{equation*}
$$

Then we consider

$$
\begin{equation*}
[L(\phi)]_{i \hbar}+\mu \phi_{i \hbar}=0 \tag{19}
\end{equation*}
$$

with the Dirichlet boundary conditions formulated above.
The computations start with approximations for a limited number of eigenfunctions. Such approximations can be obtained from a coarse grid formulation with a subsequent interpolation to the fine grid. In our example, approximations to the first four eigenfunctions have been determined. If one wants to compute the lowest eigenfunction only, then it will probably suffice if one derives from the coarse grid an approximation for only the lowest eigenfunction.

The discussion includes cases where a number of eigenvalues lie close together, for this happens frequently in multidimensional problems. In the present example, for instance, one has coincidence of the second and third eigenvalue. The coarse grid approximation will show for which eigenfunctions this is the case.

The number of eigenfunctions for which approximations are introduced is restricted; it cannot exceed the number of grid points in the coarse mesh, but one might use even a smaller number. The subscripts $i$ and $j$ which will appear subsequently refer to these eigenfunctions. Let $S$ be the subset of subscripts for those eigenfunctions which are treated simultaneously, because the
corresponding cigenvalues lie close together or coincide. The approximations to the eigenfunctions designated by the subset $S$ are updated in each iteration step, those not pertaining to $S$ remain unchanged. For the latter one always uses the best approximations available. In particular, one uses the exact eigenfunctions (usually obtained in previous phases of the procedure) if they are available.

We shall denote eigenfunctions and their approximations by $\psi_{i}$, if $i=S$ and by $\phi_{j}$ if $j \notin S$. In our example we have for the first eigenvalue $i=1, j=2,3,4$; for the second and third eigenvalues $i=2$ and $3 ; ~ j=1$ and 4; and for the fourth eigenvalue $i=4, j=1,2,3$.

Let a superscript $p$ denote the iteration number. One iteration step leads from $\psi_{i}{ }^{(p)}$ to $\psi_{i}{ }^{(p+1)}, i \varepsilon S$. The iteration starts with approximations $\psi_{i}{ }^{(0)}$ obtained by the interpolation from the coarse to the fine grid. We describe immediately the general case where $S$ contains more than $l$ element. Single eigenvalues are obtained by an obvious specialization.

The following steps are carried out.

1. Choose the subset $S$, provide approximations for the ${ }^{*} j$, $j \notin S$, and starting approximations $\psi_{i}^{(0)}, i \varepsilon S$.
2. Update the values of $\mu_{i}^{(p)}$ and form an intermediate update to the approximations $\psi_{i}^{(p)}$, i $\varepsilon S$.
3. Provide, separately for each i, i $\varepsilon S$, a second update by approximately eliminating long wave contributions due to the $i_{j}$ s, j \& S.
4. Smooth out by iteration, separately for each i $\varepsilon$ S the twice updated functions $\psi_{i}$. After a number of these steps this process gives the final approximation $\psi_{i}{ }^{(p+1)}$. If one has convergence, then one updates the eigenvalues $\mu_{i}$ and terminates the computation. Otherwise one returns to step 2.

We discuss these steps in detail and provide the necessary equations. In step 2 we set

$$
\begin{equation*}
\bar{\psi}=\sum_{i \in S} \beta_{i} \psi_{i_{2}}^{(0)} \tag{20}
\end{equation*}
$$

with coefficients $\beta_{i}$ so far unknown. In general, such functions $\cdots$ will not satisfy Eq. (18),

$$
\angle \bar{\psi}+c^{\mu} \bar{\psi} \stackrel{2}{=} 0
$$

even if one considers $\mu$ and the $\beta_{i}$ 's as arbitrary. To obtain conditions for $\mu$ and the $B_{i}$ 's we apply to the last expression weight function $\psi_{i l}{ }^{(p)}, i_{1} \varepsilon S$. Then one obtains the eigenvalue problem

$$
\begin{equation*}
\left(M^{(1)}+\mu M^{(2)}\right) \vec{\beta}=0 \tag{21}
\end{equation*}
$$

where $\vec{\beta}$ is a vector with components $\beta_{i}$, $i \varepsilon S$. The elements of $M^{(1)}$ and $M^{(2)}$ are given by

$$
\begin{align*}
& M_{i, i_{2}}^{(1)}=\left[\psi_{i}^{1}, L\left(\psi_{i_{2}}^{(p)}\right]\right.  \tag{22}\\
& M_{i, i_{2}}^{(2)}=\left[\psi_{i},(p), \psi_{i_{2}}^{(p)}\right]
\end{align*}
$$

(For the solution of this problem, one will, of course, change the subscripts.) The solution of the eigenvalue problem gives the updated eigenvalues $\mu_{i}(p+1)$ and eigenvectors $\vec{\beta}_{i}$ and subsequently (from Eq. (20)) updated approximations $\bar{\psi}_{i}$.

In the present setting the matrices $M^{(1)}$ and $M^{(2)}$ are symmetric (see the discussion in Section IV). Because of lack of precision, there may arise deviations from symmetry if one evaluates the matrix elements separately. It is then desirable to make the matrices symmetric. If the eigenvalues $\mu_{i}(p+1)$ are different, then one obtains eigenvectors $\vec{\beta}_{i}$ which are orthogonal to each other. If some of the $\mu_{i}(p+1)$ 's coincide, then one can construct vectors $\vec{B}_{i}$ which are orthogonal to each other. Critical are cases where eigenvalues $\mu_{i}(p+1)$ are different but lie very close together. The eigenvectors obtained in such a case will be different and orthogonal, but small errors in the matrices will lead to eigenvectors which are quite different (although taken together they will always span the same or approximately the same subspace of the $\beta$ space). It is then possible that the
eigenvectors change considerably from iteration to iteration depending upon small changes in the matrices. This will
introduce a numerical instability. For eigenvalues which nearly coincide one must therefore override the automatic determination of the eigenvectors and define eigenvectors within the pertinent subspace which change very little from iteration to iteration.

We illustrate by example another disturbing phenomenon which may occur. We consider for this purpose the computation of the second and third eigenfunctions. In this case, one encounters 2 by 2 matrices which have nearly diagonal form. Let us idealize

$$
\begin{aligned}
& \text { them as diagonal matrices. } \\
& \qquad\left\{\left[\begin{array}{cc}
M_{11}^{(\prime \prime} & 0 \\
0 & M_{22}^{(\prime)}
\end{array}\right]+{ }^{\mu}\left[\begin{array}{cc}
M_{11}^{(2)} & 0 \\
0 & M_{22}^{(\alpha)}
\end{array}\right]\right\}\left\{\begin{array}{l}
\beta_{1} \\
\beta_{2}
\end{array}\right)=0
\end{aligned}
$$

The determinant vanishes if

$$
\left(M_{11}^{(1)}+\mu M_{11}^{(2)}\right)\left(M_{22}^{(1)}+\mu M_{22}^{(2)}\right)=0
$$

Hence

$$
c^{\mu}=-\frac{M_{11}^{(1)}}{M_{11}^{(2)}} \quad \text { or } \quad \mu=-\frac{M_{22}^{(1)}}{M_{22}^{(2)}}
$$

To obtain the eigenvectors one substitutes these values of $\mu$. One obtains in the first case

$$
\left[\begin{array}{ll}
0 & 0 \\
0 & M_{<2}^{(\prime)}-\left(M_{11}^{(\prime \prime} / M_{1}^{(2)}\right) M_{<2}^{(2)}
\end{array}\right]\left[\begin{array}{l}
\beta_{1} \\
\beta_{2}
\end{array}\right]=0
$$

Herce, from the second of these equations

$$
\beta_{2}=0, \beta_{1}=1
$$

With inaccurate numbers the zeros which appear here will be small numbers, which are uncertain because of the lack of precision. If one inadvertently determines the ratio of $\beta_{1}$ to $\beta_{2}$ from the first equation, then one will obtain a nonsensical result, while the second equation will give the correct result. Of course,
a good eigenvalue routine will guard against this occurrence. A problem may arise, however, if one uses an ad hoc program. In the present example, the difficulty is easily avoided if one determines the ratio of $\beta_{1}$ to $\beta_{2}$ from the sum of the two equations which one obtains for the different choices of $\mu^{(p+1)}$.

If two eigenvalues coincide, then one obtains for the determination of eigenvectors

$$
\left(\begin{array}{ll}
0 & 0 \\
0 & 0
\end{array}\right)\left[\begin{array}{l}
\beta_{1} \\
\beta_{2}
\end{array}\right)=0
$$

This system of equations is satisfied by any linear combination of $\beta_{1}$ and $\beta_{2}$. With inaccurate information about the matrix elements, one will obtain specific vectors $\beta_{1}$ and $\beta_{2}$, but the form of these vectors will depend upon the inaccuracies and may vary from iteration to iteration. To guard against this occurrence we have chosen

$$
\beta=\left(\begin{array}{l}
1 \\
0
\end{array}\right] \text { and } \beta=\left(\begin{array}{l}
0 \\
1
\end{array}\right]
$$

if we found by a test that the eigenvalues are very close together.
In the following steps the functions $\bar{\psi}_{i}$ with approximate eigenvalues $\mu^{(p+1)}$ i $\in S$, are treated separately for each $i$.

In step 3 the long wave contributions due to the approximate eigenfunction $\phi_{j}, j \notin S$ are approximately removed. We set

$$
\begin{equation*}
\bar{\psi}_{i}=\bar{\psi}_{i}+\sum_{j_{2} \leqslant s} \alpha_{v_{2}} \phi_{j_{2}} \tag{23}
\end{equation*}
$$

The $\alpha_{j}$ 's are determined by the requirement that this expression be orthogonal to the functions $\phi_{j_{1}},\left(j_{i} \varepsilon S\right)$. One then obtains

$$
\begin{equation*}
M^{(a)} \alpha+r^{(3)}=0 \tag{24}
\end{equation*}
$$

Where $\alpha$ is a vector with $j^{\text {th }}$ component $\alpha_{j 2}, j_{2} \notin S$ and the matrix elements are given by

$$
\begin{equation*}
M_{j, j_{2}}^{(s)}=\left[\varphi_{j 1}, \varphi_{j_{2}}\right] ; j_{1} \nLeftarrow S ; j_{2} \notin S \tag{25}
\end{equation*}
$$

and

$$
\begin{equation*}
\tilde{j}_{j}=\left[\varphi_{j i}, \bar{\psi}_{i}\right] \tag{26}
\end{equation*}
$$

For the actual computation a renumbering of the subscripts will be carried out.

In our program we have actually proceeded in a different manner because of a somewhat uncritical analogy to the procedure for the inhomogeneous problem. We believe, however, that the method descr_bed above is preferable. We have formed the residual pertaining to Eq. (23)

and obtained conditions for the $j_{2}$ by postulating that this expression be orthogonal to the $j_{1}{ }^{\prime} s, j_{1} \notin S$. Tith the values of ${ }^{j}$ so found one then compates $\because_{i}$ from Eq. (23).

In step 4, one eliminates short wave perturbations by an iterative procedure (in our case by the alternating direction method). This is done separately for all values of i, i $\varepsilon$. If these iterations converge, then one terminates the procedure and proceeds to another set $S$ of eigenvalues. Before the termination, one may update the eigenvalues $\mu$ by the method of step 2 for a last time. If the convergence is slow, then one goes back to step 2 using the expression $\psi_{i}$ obtained by the alternating direction iteration as starting approximation ( $p+1$ ) -i

## $\therefore \mathrm{Br}$ Cllon VI

 にICENVAI,H: PROMIIMM
'lhe procodure desceibed fationtion $V$ has bern implemented usimy a thited dogred intorpolation formala to procond trom the contse to the tine arid. We format that it converges rather well. With limenr intorpolat ion, the mocomme hoss beon triod anly for
 $i \quad 1$ is sat istactory, but dubious tor i 4. The question whether the procorlare rerommended in the prosedime seret ion tor stop 4 would be bemeticeial hati not boon explotied.

## REFERENCE

Brandt, Achi, Multi-Level Adaptive Solutions to Boundary Value problems, Mathematics of Computation, Vol. 31, (April 1977) pp. 333-390.


[^0]:    "If your address has changed, if you wish to be removed from our mailing list, or if the addressee is no longer employed by your organization please notify AFFDL/FBRDW-PAFB, OH 45433 to help us maintain a current mailing list".

